



# Exploration of Composites Processing and Producibility by Analysis

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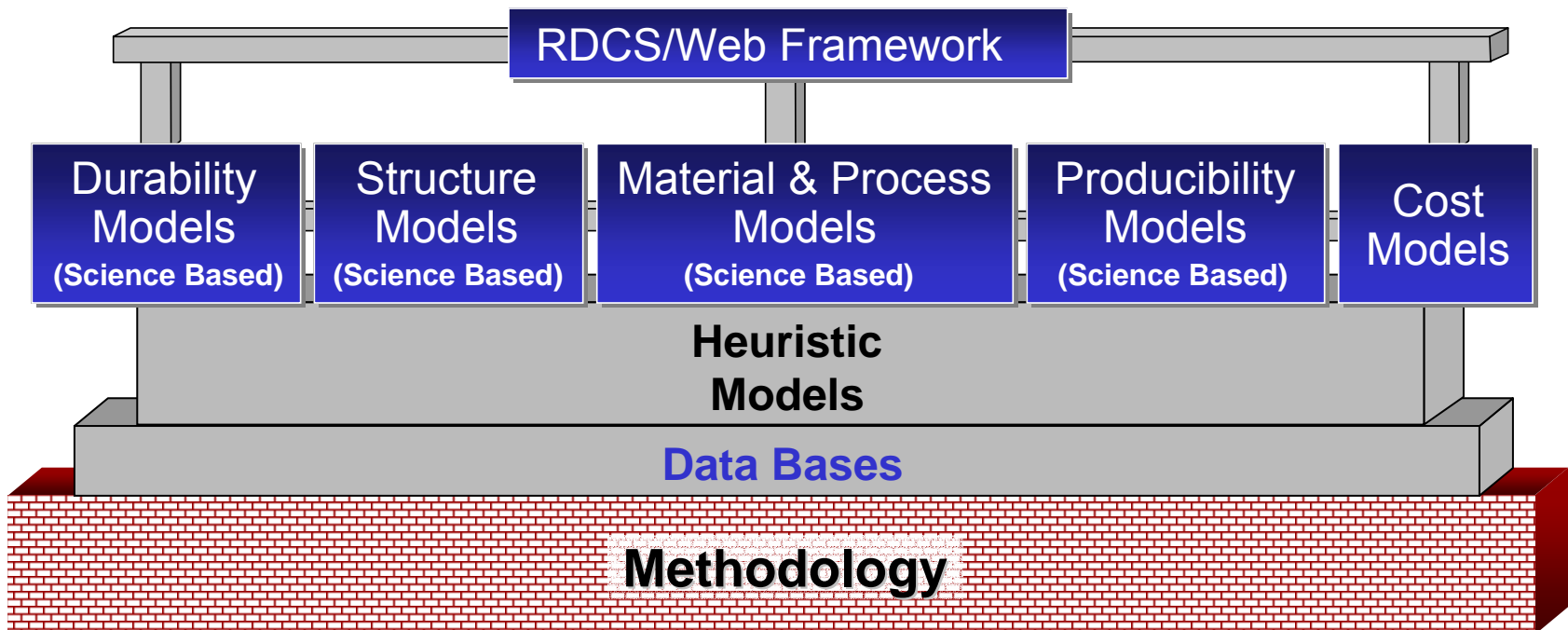
# Outline

- Background
  - Accelerated Insertion of Materials – Composites (AIM-C)
  - Robust Design Computational System (RDCS)
- Purpose and Objectives
- Problem Description
- Computational Approach
- Results
- Summary
- Future Work

# BACKGROUND

## The AIM-C Plan

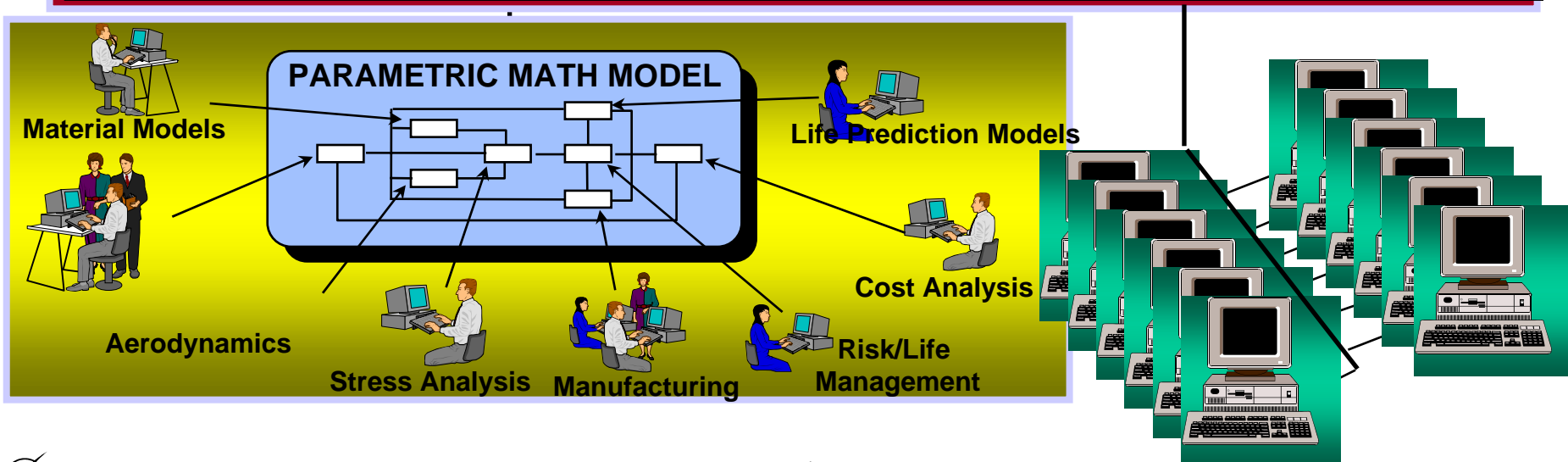
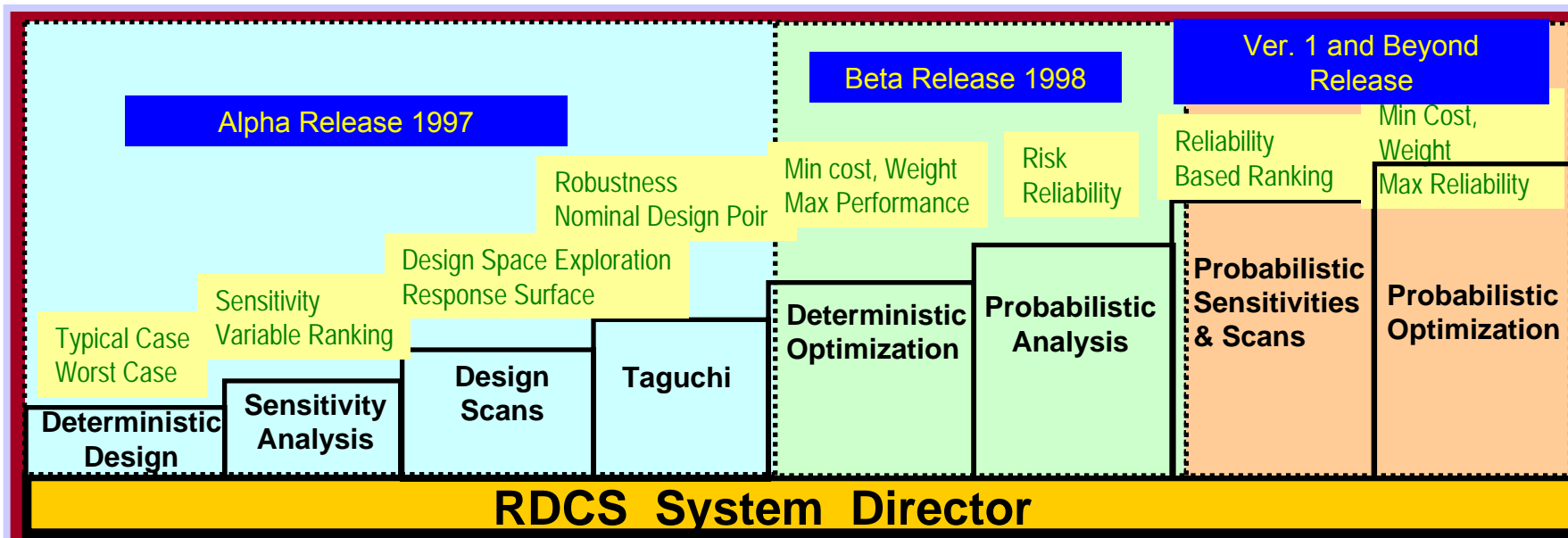
- Incorporate methodology into an interface that guides the user and tracks the progress of technology maturation to readiness
- Deliver software in steps toward a useable system as analysis modules are completed
- Demonstrate capability through system validation, compelling technical demonstration, and a 'blind validation' to insure usability



RDCS – Robust Design Computational System

# BACKGROUND

## RDCS Tool An Instance of Modern Design Framework



# Purpose and Objectives

## Purpose:

- Utilize an RDCS driven feature based parametric processing model for producibility assessments through the web based front-end of the producibility module

## Objectives:

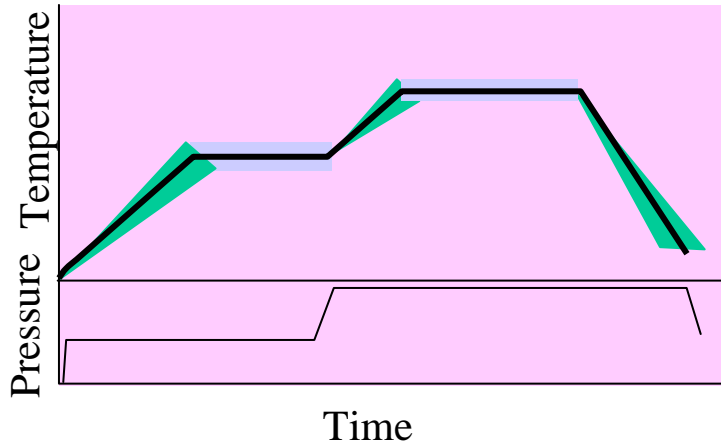
- Illustrate parameterization of process module
- Show current stage of module development
- Highlight integration issues and direction of work
- Demonstrate feature based parameterized producibility assessment

## Approach:

- Parameterize geometry inputs to Processing Module based on use scenario for a Producibility Assessment. Exercise with RDCS tools through linkage with producibility module.

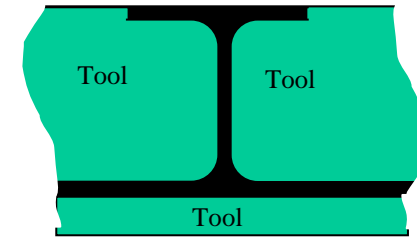
# Use Scenario and Problem Statement

## Composite System Cure Requirements

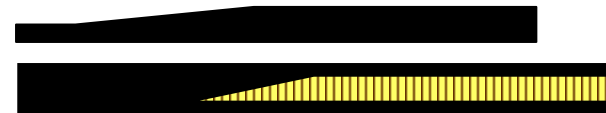


- Resin chemistry requirements
- Consolidation requirements
- In-cure and residual stresses
- Minimum and maximum rates
- Minimum and maximum hold times
- Intermediate temperature holds

## Design and Tooling Requirements



Thermally massive tooling, inserts  
Co-Cure Structure, Lug Plates

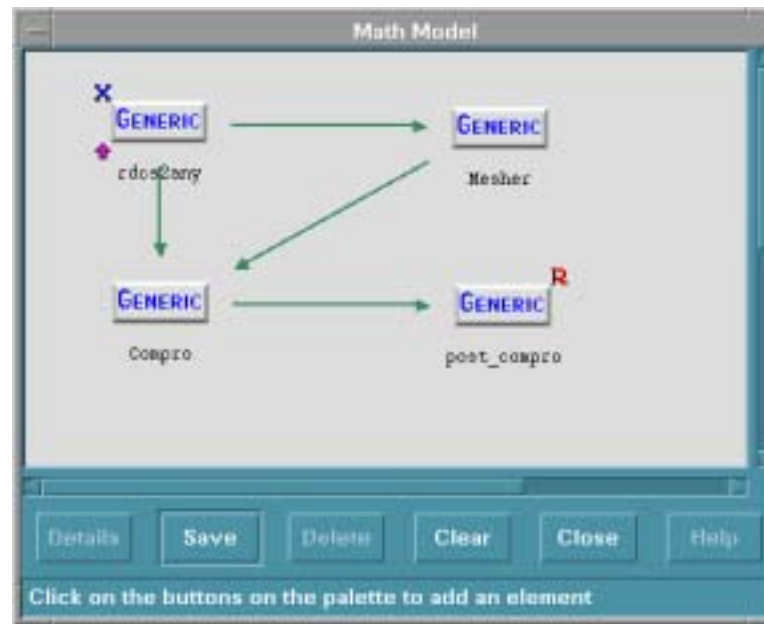
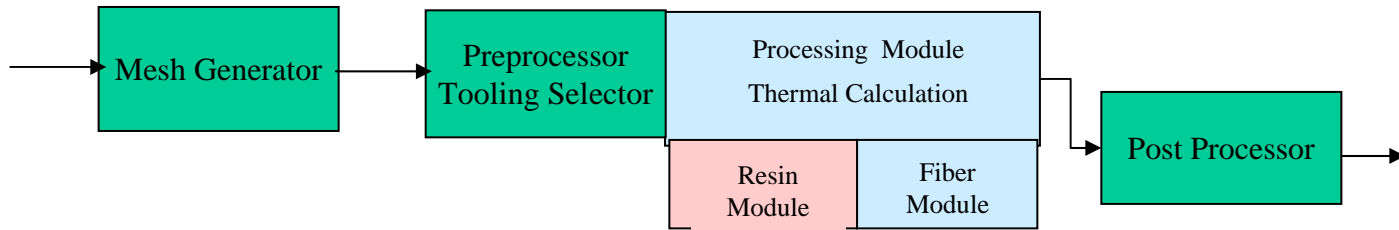


Thick and Thin Sections  
Keel beams, Attachment points  
Combinations of Above

Evaluate Design Driven Requirements Relative to Material and Processing Requirements for Heat-up Rate and Exotherm Producibility Issues

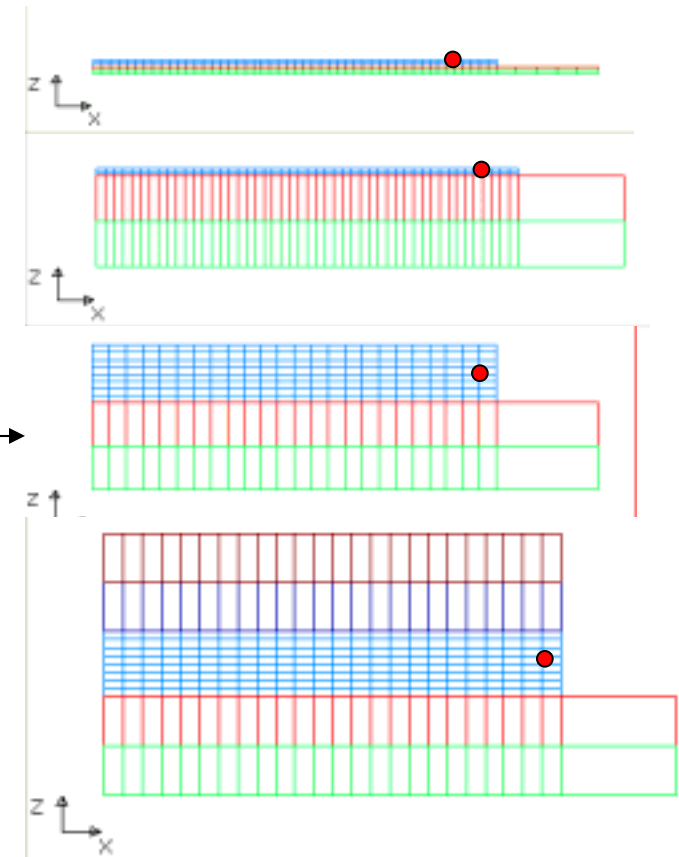


# Simulation Integration Structure



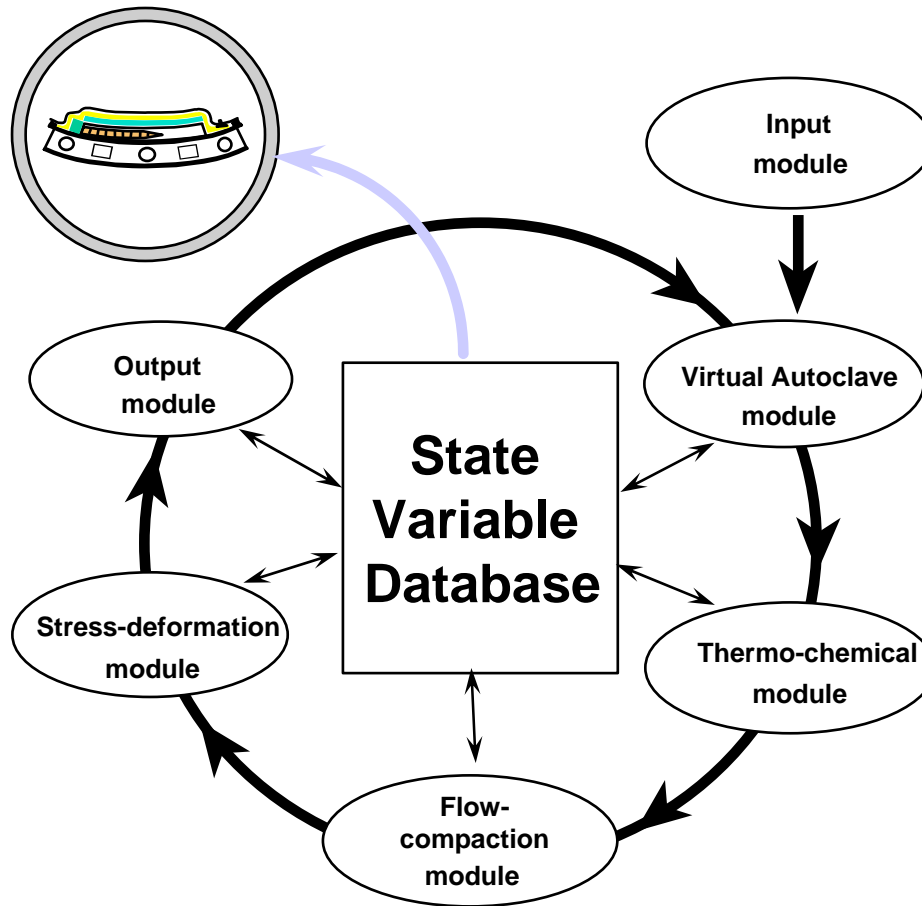
# Parametric flat panel mesh generator

<u>Part</u>	<u>Tool</u>	<u>Top Tool</u>
0.25"	3.00"	0"
2.00"	3.00"	3.00"
0.25"	3.00"	3.00"



- Virtual Thermocouple for Autoclave Control  
Assigned to mesh by preprocessor

# Processing Module Description



- Part/Tool Geometry
- Process Cycle
- Autoclave Characteristics
- Material Behaviour

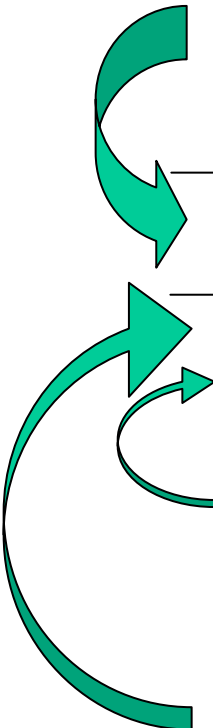
- F.E. Description
- Autoclave Simulation
- $h = f(P, T)$
- Material models

- Temperature, Resin Degree of Cure, volume fraction
- Part Thickness Profile
- Part Deformations
- Residual Stress

Based on CMT's COMPRO Simulation Software

## Input/Output requirements

### Parametric Feature Inputs



	Input Requirement	Units	Min.		Max.	Variable Type
G	Part Thickness	Inches	0.25		2	User Entered
H	Top Tool Thickness (3)	Inches	0		3	User Entered
I	Tool Thickness	Inches	0.50		3	User Entered
J	Tool Material (5)		Invar <1>	Aluminum <2>	Composite <3>	User Entered
K	Autoclave Pressure	Psi	45	85	125	User Entered

#### Autoclave Pressure Input

- As required for consolidation as determined through experimentation

#### Tool Material Input for Preprocessor

- Integer value output from producibility to RDCS
- Integer value to data set in preprocessor

## Input/Output requirements

### Process bounds for exploration in RDCS

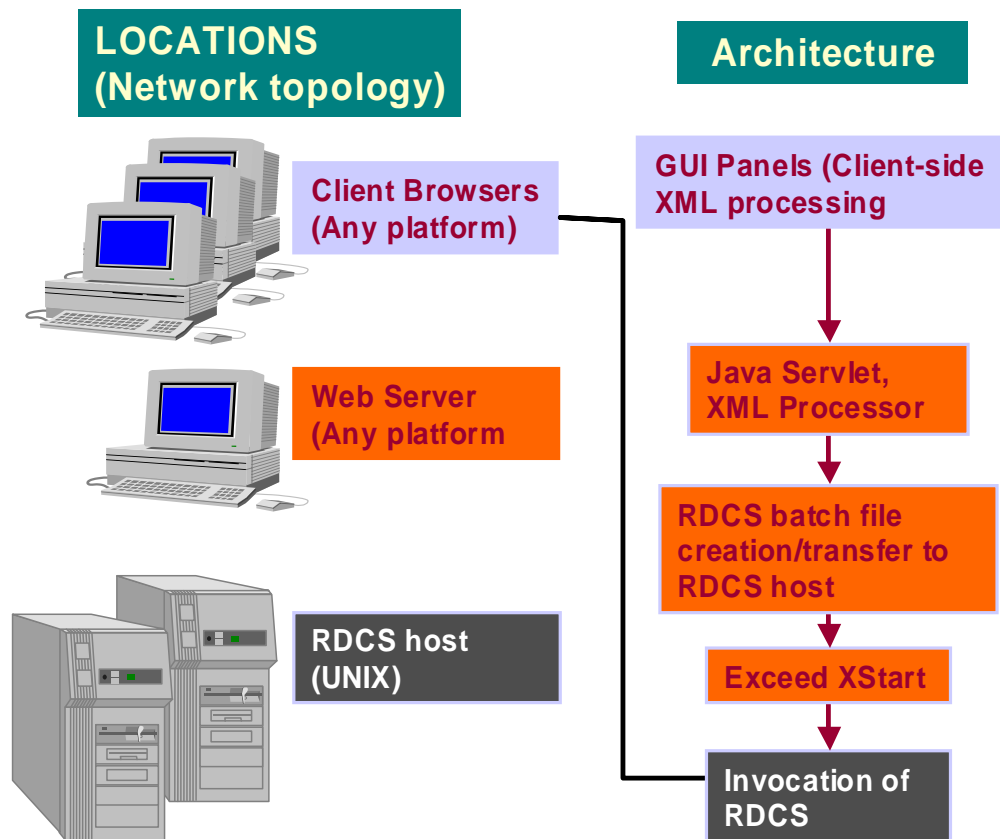
	Input Requirement (Process Bounds)	Units	Demo Min.	Demo Max.	Variable Type
L	Heat Transfer Coefficient (1) (2)	BTU/h.ft <sup>2</sup> .F	3	7	Independent Process Noise Variable
M	Ramp 1 Rate (air)	F/min	2	10	Independent Process
N	Hold 1 Temperature	F	270	290	Independent Process
O	Hold 1 Time (part ) (4)	Min	0	120	Independent Process
P	Ramp 2 Rate (air)	F/min	2	10	Independent Process
Q	Hold 2 Temperature	F	355	365	Independent Process
R	Hold 2 Time (part )	Min	360		Independent Process
S	Ramp 3 (air)	F/min	-2	-10	Independent Process

## Input/Output requirements

### Constraints for RDCS Outputs

	Input Requirement (Constraints)	Units	Min.	Max.	Variable Type
A	Acceptable part heat up rate	F/min	1	5	Dependent User Entered Constraint
B	Acceptable time at final cure temperature	Minutes	360	380	Dependent User Entered Constraint
C	Resin maximum acceptable Temperature	F	345	365	Dependent User Entered Constraint
D	Maximum acceptable heat up gradient	F	0	50	Dependent User Entered Constraint
E	Maximum acceptable cool down gradient	F	0	50	Dependent User Entered Constraint
F	Resin acceptable cool down rate	F/min	-1.5	-5	Dependent User Entered Constraint

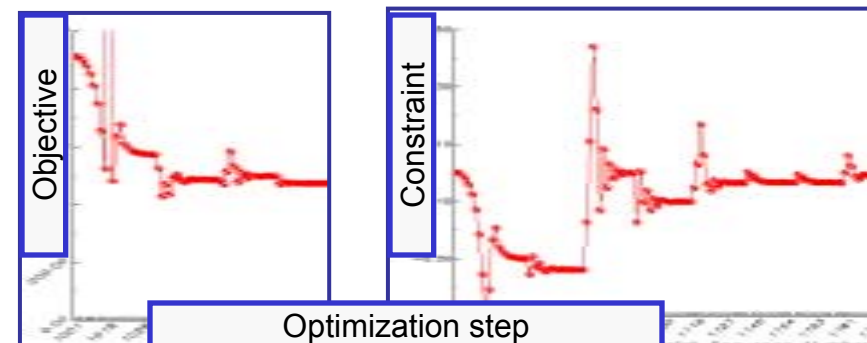
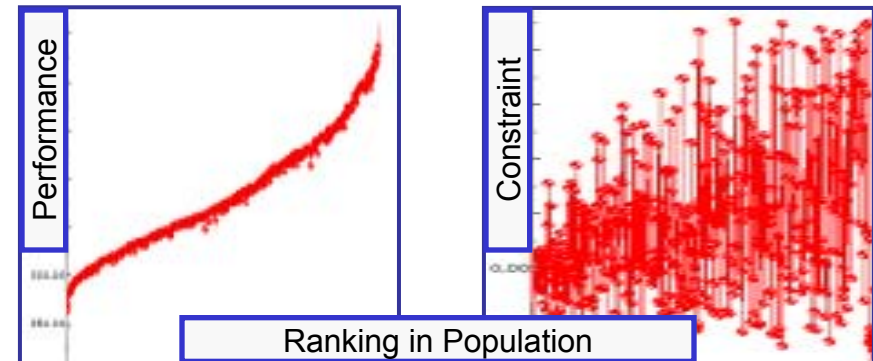
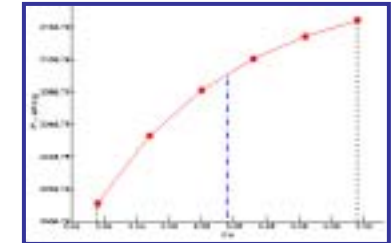
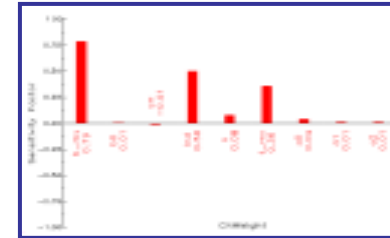
# Producibility - RDCS Integration Structure



# Design Space Exploration Options

- Traditional Design Methods
  - Sensitivity
  - Design Space Scan
- Genetic Algorithm:
  - 1 - Randomly sample **entire** design space
  - 2 – Evaluate objective and constraints for each design; form performance function
  - 3 – Swap design variables (traits or “genes”) between the best performing designs to form a new generation; **go to step 2**
- Gradient based methods:
 

Use **local** sensitivities of objective and constraint functions to drive the design to an optimal feasible design





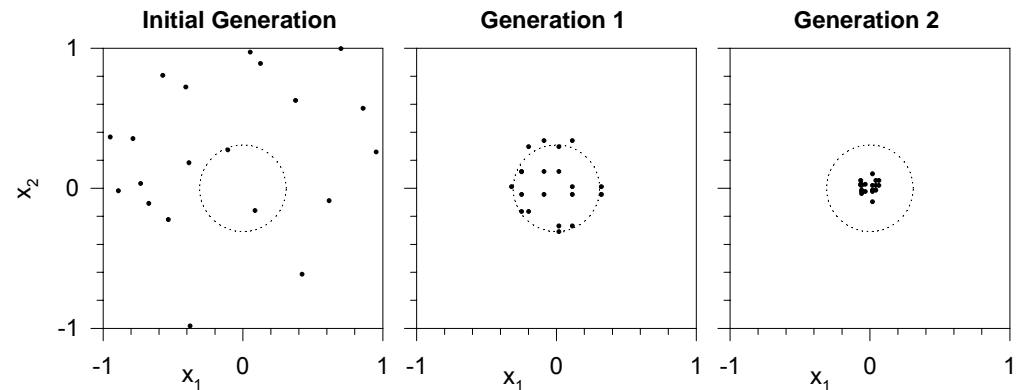
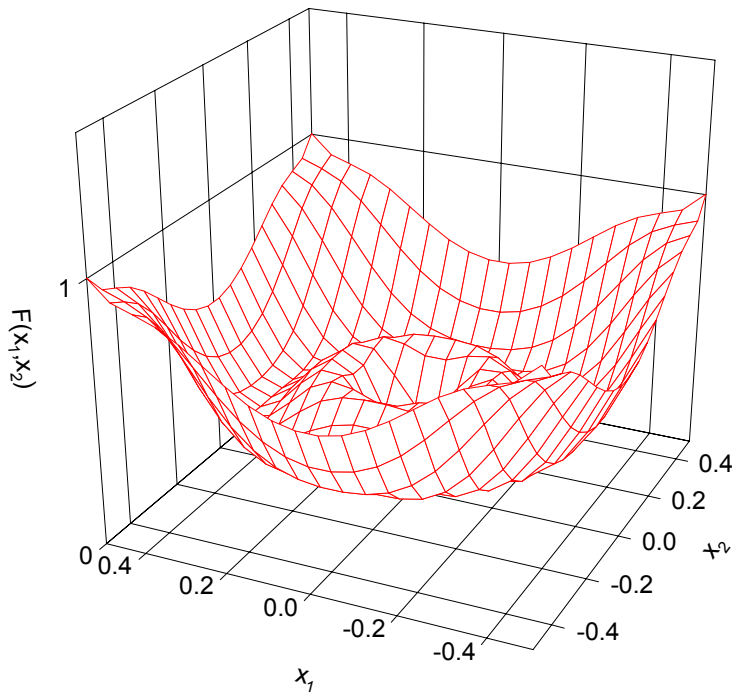
# Strategy for Searching a Feasible Cure Cycle

- Design space: 13 variables, 30 responses, 13 constraints
- Strong interaction between variables is expected
- Sensitivity - point information, not suitable for global exploration
- Design space scan
  - Needs off-line post-processing to find feasible designs
  - Partial design space scan won't capture interactions
  - Full factorial is impractical for this many variables (3 levels for each variable ~1.6 million cases)
- Optimization - minimize cure cycle time subject to bounds in design variables and constraints in responses
  - Processing Module results carry some numerical noise (typical for complex numerical problems); Classical gradient based optimizers will fail
  - Genetic Algorithm is an effective solution

# Genetic Algorithm Description

## Multi-modal objective to test GA

Rippled Response Surface



Pattern of successive generation for multi-modal response

Traditional optimizers may fail to find global optimum

## Demonstration Cases

	Input Requirement	Units	Case 1	Case2	Case 3.	Case 1A
G	Part Thickness	Inches	0.25	2	2	0.25
H	Top Tool Thickness (3)	Inches	3	0	3	3
I	Tool Thickness	Inches	3	0.5	3	3
J	Tool Material (5)		Composite <3>	Composite <3>	Composite <3>	Aluminum <2>
K	Autoclave Pressure	Psi	85	85	85	85

## Challenging Tool and Part Thickness

# AIM-C Producibility GUI - Constraint Definition

Http://bcp-structurestechnology.rdyne.bna.boeing.com/aimc/index.html - Microsoft Internet Explorer provided by Boeing Canoga Pa

Address <http://bcp-structurestechnology.rdyne.bna.boeing.com/aimc/index.html> Go

File Edit View Favorites Tools Help

## Constraints

Description	Limit.	Hard Limit.	Unit
Minimum part heat-up rate	1	> 0.5	(F/min)
Maximum part heat-up rate	5	< 10	(F/min)
Minimum time at final cure temperature	360	> 1	(min)
Maximum time at final cure temperature	380	< 720	(min)
Minimum peak resin temperature	100	> 100	(F)
Maximum peak resin temperature	365	< 800	(F)
Maximum acceptable heat-up gradient	50	< 150	(F/in)
Maximum acceptable cool-down gradient	50	< 150	(F/in)
Minimum resin cool down rate	1.5	> 0.5	(F/min)
Maximum resin cool down rate	5	< 10.0	(F/min)

Run

Done Local intranet

# Detail of RDCS project generated by the AIM-C Producibility module

**Optimization Setup**

☐ Maximize ☒ Minimize

Objective Function  $f(x,R)$ :

[total\_run\_time]

Subjected to the following constraints  $g_i(x,R)$ :

1:  $(5 - \text{max\_part\_heat\_rate\_r1}) / 5 \geq -0$   
 2:  $(\text{min\_part\_heat\_rate\_r1} - 1) / 1 \geq -0$   
 3:  $(5 - \text{max\_part\_heat\_rate\_r2}) / 5 \geq -0$   
 4:  $(\text{min\_part\_heat\_rate\_r2} - 1) / 1 \geq -0$   
 5:  $(380 - \text{max\_time\_hold\_r2}) / 380 \geq -0$   
 6:  $(\text{max\_time\_hold\_r2} - 360) / 360 \geq -0$   
 7:  $(365 - \text{max\_part\_temp\_r2}) / 365 \geq -0$   
 8:  $(\text{max\_part\_temp\_r2} - 100) / 100 \geq -0$   
 9:  $(50 - \text{max\_temp\_grad\_r1}) / 50 \geq -0$   
 10:  $(50 - \text{max\_temp\_grad\_r2}) / 50 \geq -0$   
 11:  $(50 - \text{max\_temp\_grad\_cool}) / 50 \geq -0$   
 12:  $-(1.5 * \text{max\_part\_cool\_rate}) / 1.5 \geq -0$   
 13:  $(\text{max\_part\_cool\_rate} + 5) / 5 \geq -0$

[ ] = 0 [Add] [Delete]

Valid Design Variables:

Input Variables	Status	Lower Bound	Starting Point	Upper Bound	Norm Const
heat_trans_coe	<input type="radio"/> Design Var. <input checked="" type="radio"/> Fixed		5.0		
ramp1_rate	<input checked="" type="radio"/> Design Var. <input type="radio"/> Fixed	2.0	5.0	10.0	1.0
hold_1_temp	<input checked="" type="radio"/> Design Var. <input type="radio"/> Fixed	270.0	285.0	290.0	1.0

Advanced

[Ok] [Cancel] [Help]

Notes:

-Positive constraint values indicate feasible design

- The amount of constraint violation is normalized with the response limit; Criticality of different constraints can be compared.

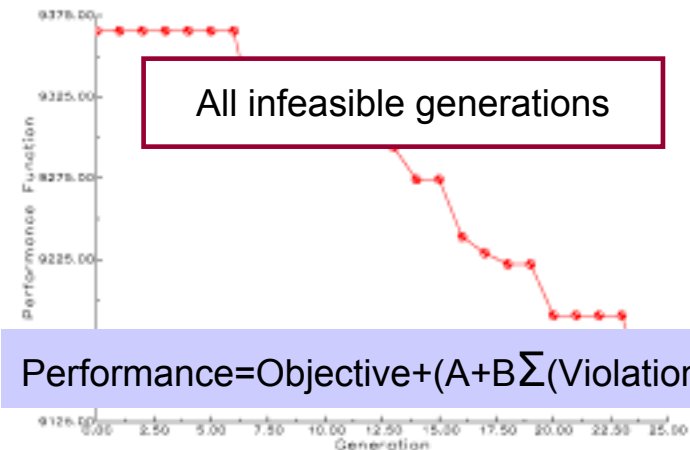
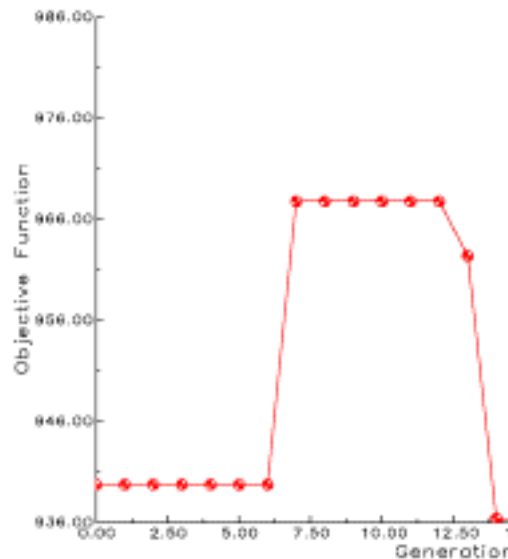
# Results Summary

	Input Requirement	Units	Case 1	Case2	Case 3.	Case 1A
G	Part Thickness	Inches	0.25	2	2	0.25
H	Top Tool Thickness (3)	Inches	3	0	3	3
I	Tool Thickness	Inches	3	0.5	3	3
J	Tool Material (5)		Composite <3>	Composite <3>	Composite <3>	Aluminum <2>
K	Autoclave Pressure	Psi	85	85	85	85

Acceptable solution not obtained for Cases 1, 2, and 3  
Not Producing given process bounds.

Case 1 rerun with Aluminum tooling (Case 1A)  
Acceptable process found

# Summary of Case 1



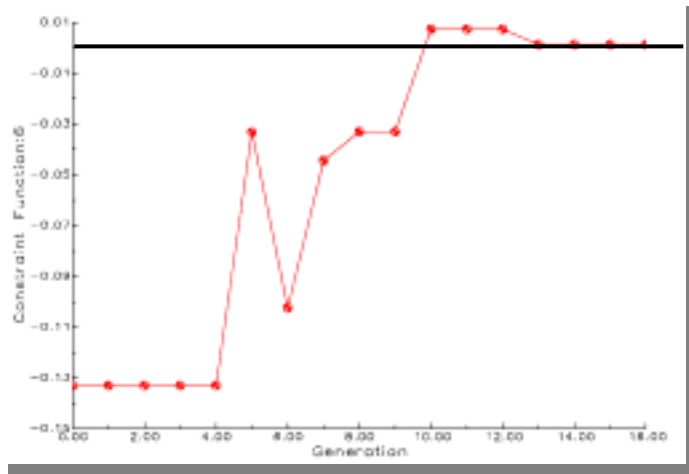
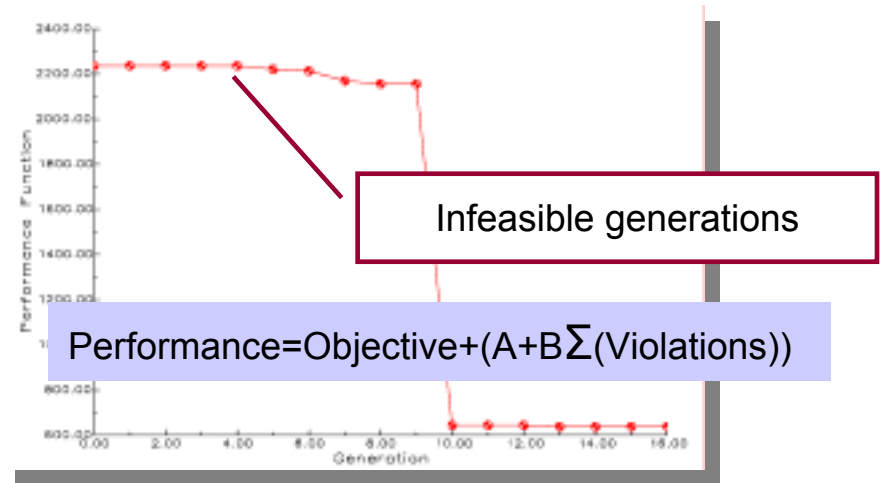
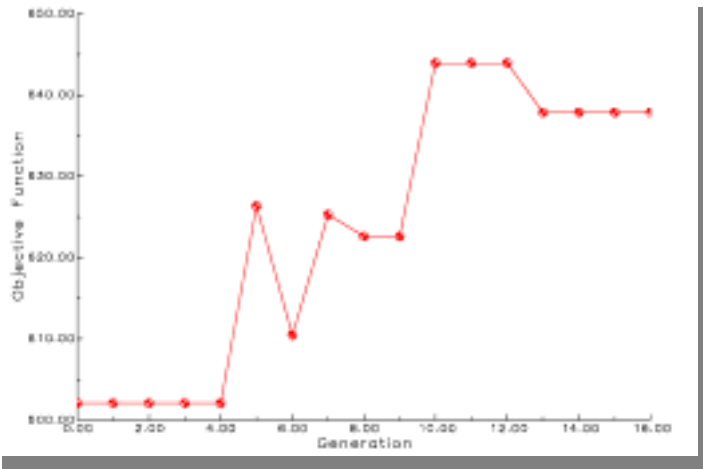
All infeasible generations

Performance=Objective+(A+B $\sum$ (Violations))

## Violated constraints

- 2 - Minimum part heat-up rate
- 4 - Minimum part heat-up rate at ramp 2
- 6 - Minimum time at final cure temperature
- 9 - Minimum peak resin temperature
- 10 - Maximum acceptable heat-up gradient
- 11 - Maximum acceptable cool-down gradient
- 12 - Minimum resin cool down rate

# Summary of Case 1A



## Important constraints

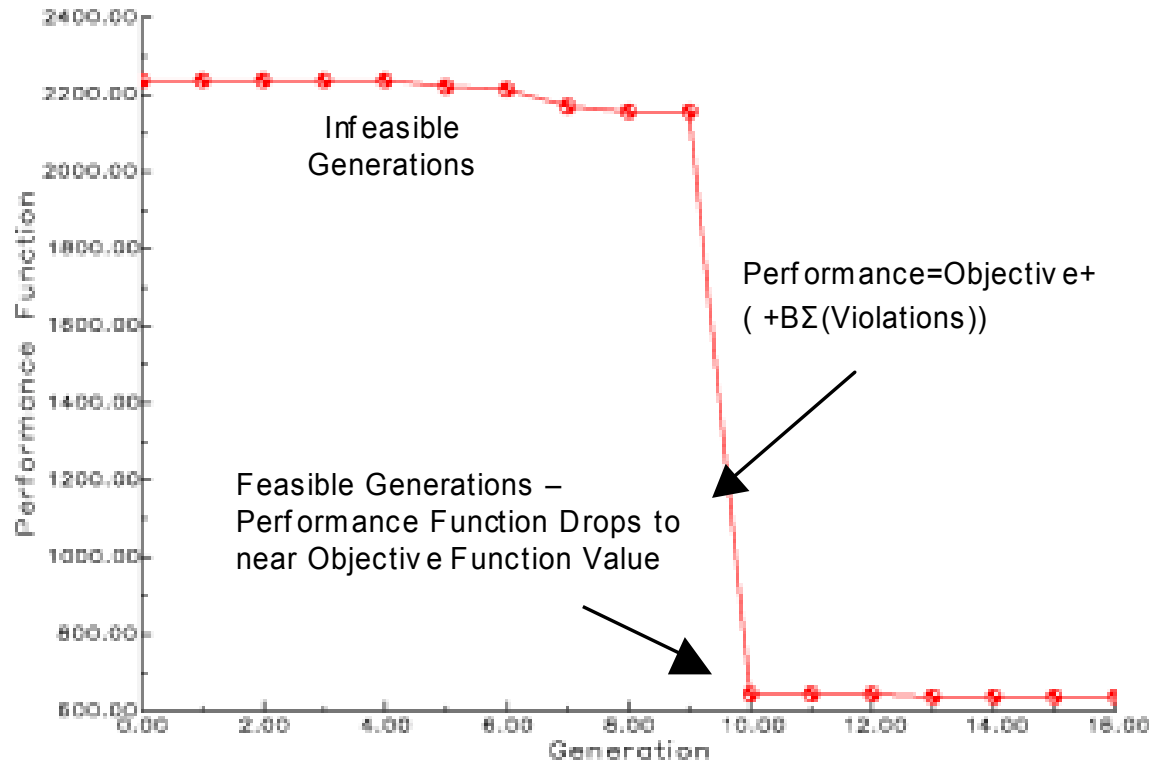
- 4 - Minimum part heat-up rate at ramp 2
- 5 - Maximum time at final cure temperature
- 6 - Minimum time at final cure temperature
- 7 - Maximum acceptable heat-up gradient

Resource needs: ~ 550 evaluations

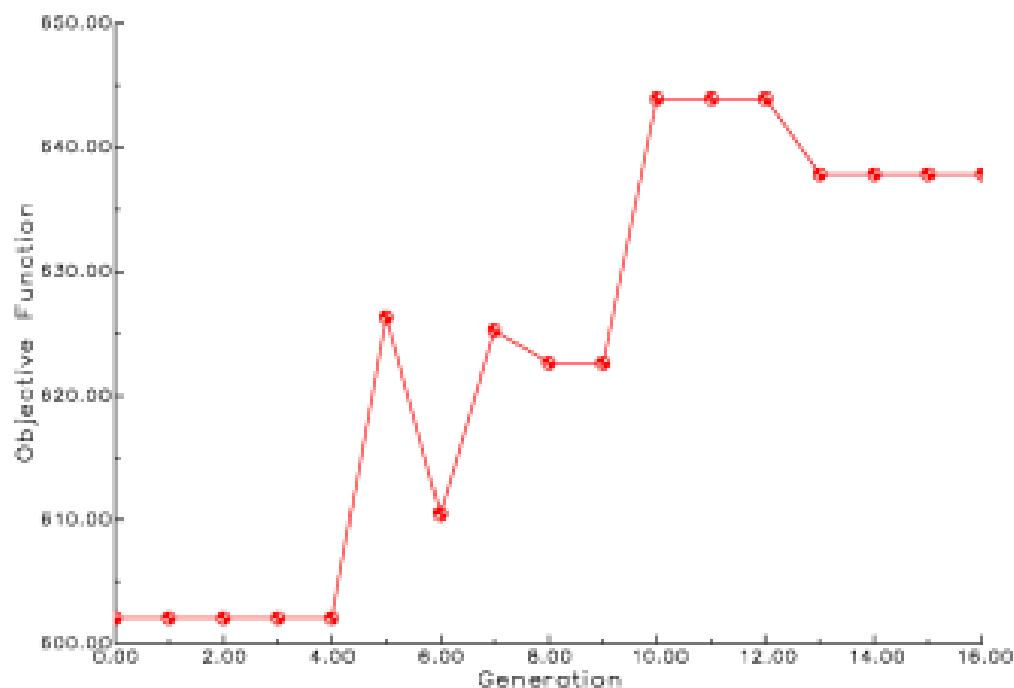
3 hrs wall clock time (100 workstations)



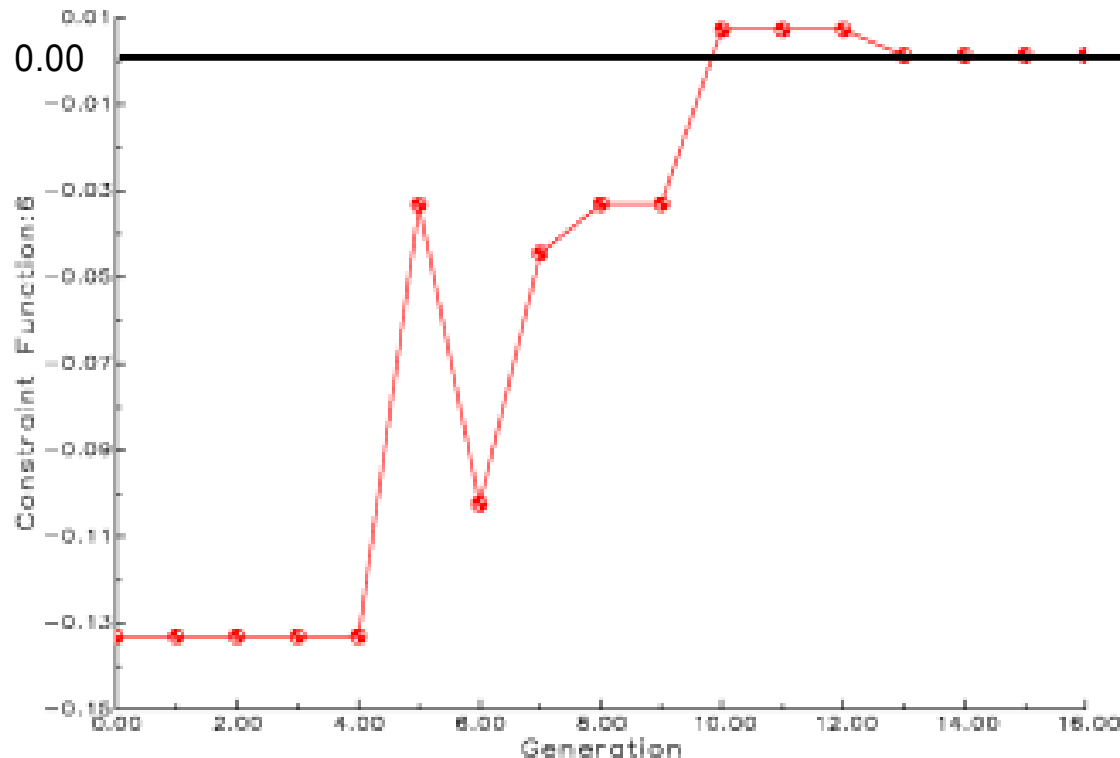
# RDCS Genetic Algorithm Performance Function Vs. Generation for Case 1A



# RDCS Genetic Algorithm Objective Function vs. Generation for Case 1A



# RDCS Genetic Algorithm Constraint Function 6 (minimum time at final cure) vs. Generation for Case 1A



## Case 1A Results- Comparison to Constraint

Input Requirement (Constraints)	Units	Min. Constraint	Min	Max	Max. Constraint
Acceptable part heat up rate	F/min	1	1.8259	1.8683	5
Acceptable time at final cure temperature	Minutes	360	360.46	377.74	380
Resin maximum acceptable Temperature	F	345		362.2	365
Maximum acceptable heat up gradient	F	0		24.1 R1 11.8 R2	50
Maximum acceptable cool down gradient	F	0		29.6	50
Resin acceptable cool down rate	F/min	-1.5	-2.643	-2.5468	-5

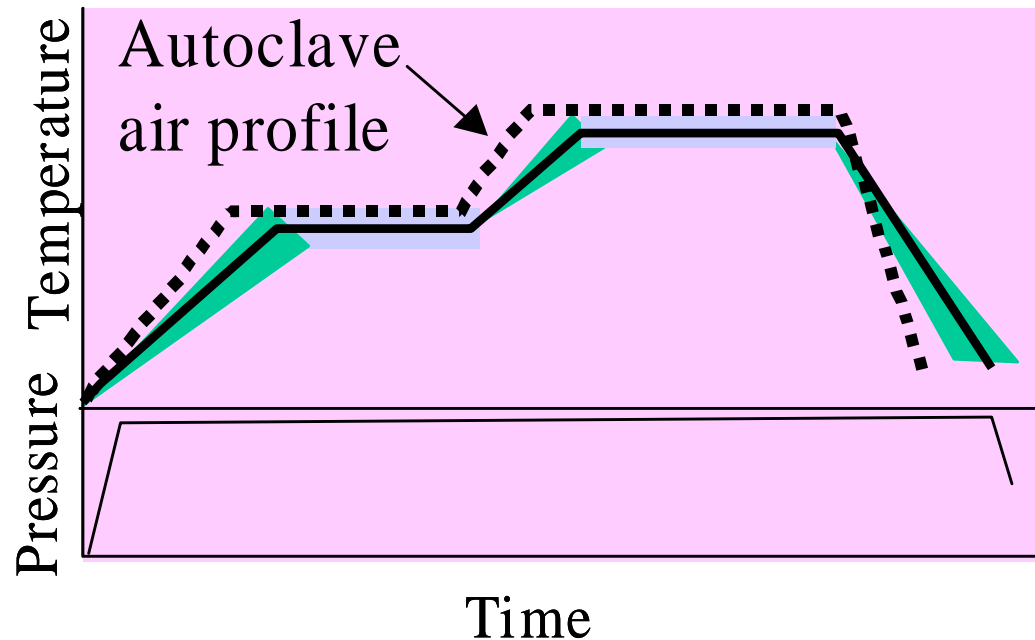
R1 - First Ramp

R2 – Second Ramp

## Case 1A Results- Autoclave Air Temperature Profile

Input Requirement (Process Bounds)	Units	Demo Min.	Case 1A	Demo Max.
Ramp1 Rate (air)	F/min	2	7.119	10
Hold 1 Temperature	F	270	273.45	290
Hold 1 Time (air ) (4)	Min	0	6.385	120
Ramp 2 Rate (air)	F/min	2	8.627	10
Hold 2 Temperature	F	355	362.42	365
Hold 2 Time (air)	Min	360	361.83	380
Ramp 3 (air)	F/min	-2	-7.059	-10

## Notional Depiction of Cure Profile to Meet Requirements for Case 1A



Process cycle developed such that all areas of part meet constraints



# Summary

- Integrated Producibility-Compro-RDCS design tool has been demonstrated
- Tool was used to search for feasible cure cycles
- Feasible designs were not found in all cases
  - Insight into the process
  - Options: change tooling material or relax constraints
  - This is precisely what the AIM-C facilities are intended for:

Identify and solve design/producibility problems early to avoid cost and schedule overruns

# Future Work

- Evaluate cases 2 and 3 with Aluminum, Invar tools
- Evaluate thin part on thin tooling
- Improve Producibility – RDCS Linkage
- Display RDCS results without RDCS GUI
- Investigate uncertainty analysis/robust design
- Effects of materials properties, heat transfer characteristics



# Integration Structure and Proposed Improvements

